

Should milk be a factor in a New Zealand asset pricing model?

By

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Abstract

In New Zealand, Milk plays a significant role in determining the economic progress of the country. Since its incorporation in 2001 Fonterra has been the leading dairy company. It currently accounts for 95% exports of milk produced in New Zealand. Fonterra is a cooperative, and its stock can only be held by and traded among its farmer members. For this reason, the fluctuation in milk prices has a strong direct impact on farmers' incomes, but just an indirect impact on the incomes of outside (non-farmer) investors. The Fonterra Shareholder Market is a private market and is not included in the NZX50. The aim of this project is to explore whether milk price is an additional factor that investors are exposed to in addition to other market risks that are measured by the NZX50. An augmented market model is used to explore the sensitivity between company return, the NZX50, and milk prices. A cointegration test is also conducted to examine the relationship between market return and milk return. The project finds some evidence that there was a milk price effect in the period before 2013 when the Fonterra Shareholders' Fund was created. The Fonterra Shareholders' Fund provides exposure to milk price risk on the NZX. The effect is a small adjustment to the usual CAPM beta. There is no evidence of the effect after 2013.

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Abbreviations

APT	Arbitrage Pricing Theory
ADF	Augmented Dickey-Fuller Test
CAPM	Capital Asset Pricing Model
FSF	Fonterra Shareholder Fund
FSM	Fonterra Shareholder Market
NSD	New Zealand Dollar
NZX	New Zealand Main Board
RVP	Register Volume Provider
TAF	Trading Among Farmers
USD	United States Dollar

Chapter One:

Introduction

1. Introduction

1.1 Overview

The dairy industry is an important component of the New Zealand economy. It is a leading export earner and sells 95% of its products into the world market. A central component of the New Zealand dairy industry is the Fonterra Co-operative Group Limited (Fonterra). Fonterra was formed in 2001 from a merger of the two largest co-operatives at that time: the New Zealand Dairy Group and the Kiwi Co-operative. Fonterra currently accounts for 95% of exports of milk produced in New Zealand. Fonterra is owned and controlled by around 14,500 New Zealand co-op dairy farmer members that use its services and share equally the earnings of the business. To be a Fonterra shareholder, farmers have to supply milk to the company in New Zealand.

Before 2013 there was no direct way for the public to invest in Fonterra. Fluctuations in milk prices will have had a strong direct impact on farmers' incomes, but this risk could not be easily diluted on the financial market. Non-farmer investors could not include the exposure to dairy prices directly in their portfolios.

The situation changed in 2013 when Fonterra created a new class of shares. There are now two types: The Fonterra Shareholders' Market (FSM) and The Fonterra Shareholders' Fund (FSF). The Fonterra Shareholders' Market (FSM) is a private market. Only Fonterra, Fonterra Farmer Shareholders, and an appointed market maker are allowed to trade Fonterra Shares. Shares can only be held by and traded among its farmer members. However, farmer members can now deposit shares in the Fonterra Shareholders' Fund. Units of the fund are listed on the New Zealand and Australia stock exchanges. They can be purchased and traded by members of the public.

This raises questions for asset pricing models and motivates the present study. Asset models are usually derived under assumptions of competitive and liquid markets. For instance, the Capital Asset Pricing Model (CAPM) is a single factor model. Should milk price be an additional risk factor in the period prior to 2013? Is the situation different now?

1.2 Research Questions

This study uses the framework of the Capital Asset Pricing Model to investigate milk price risk in the context of the New Zealand dairy industry, with co-operative farmers who have a non-marketable investment risk. It also explores the effects of milk prices on asset prices over the period 2005 to 2016. Specific questions are:

1. What are the characteristics that would make the risk of an asset greater or lower in the presence of milk price risk?
2. Does milk price risk have an observable price in New Zealand, or is it completely diversified?
3. Is there evidence of a milk price effect on assets in New Zealand?
4. Is there evidence of a change in the effect of milk price risk following the change to Fonterra's capital structure in 2013?

1.3 To whom will this study be of interest?

This study will be of interest to students of the Capital Asset Pricing Model and its extensions. The CAPM has known shortcomings and many effects additional to market risk have been documented in the literature. This study investigates a milk price effect that can be associated with a particular market imperfection.

The study will also be of interest to financial analysts when forming investors' portfolios and calculating the cost of capital for publicly listed companies. Financial analysts need to understand the effects of this market imperfection even if it is small, and whether it is ongoing.

This research will also be an interest to other countries that might have similar market imperfections. For instance, cooperatives include the Arla Cooperatives in the European Union, Friesland Campina Cooperative in the Netherlands, Foremost Farms Cooperative in the U.S, Began Cooperative in Australia and Amul Cooperative in India.

1.4 Dissertation structure

The organisation of this dissertation is as follows. Chapter 2 is a literature review. Chapter 3 examines the role of Milk and of Fonterra in the New Zealand economy. Chapter 4 presents the methodology used in the study. Chapter 5 outlines the data. Chapter 6 presents the results. Chapter 7 concludes.

Chapter Two:

Literature Review

2. Literature Review

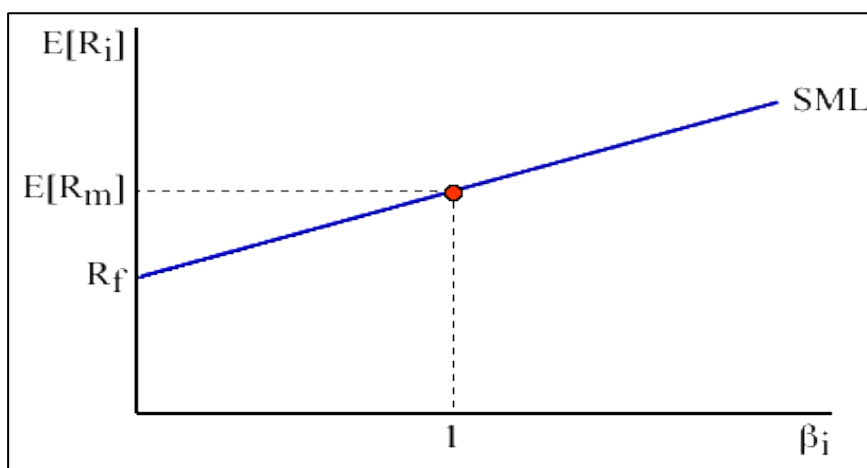
2.1 Asset Models

2.1.1 Capital Asset pricing model

The Capital Asset pricing model (CAPM) was developed simultaneously by William Sharpe (1964) and Treynor (1961), and was developed further by Mossin (1966), John Linter (1965) and Black (1972). It argues that the expected return on a security depends only on the sensitivity of its return to the market return. It is a single factor model where the stock return is explained solely by the market return. Specifically, expected return on a stock is determined by the risk-free rate of return, the stock's beta, and the expected market return.

Essentially, it states an asset is expected to earn a risk-free rate of return plus a compensation for bearing risk. Figure 1 describes the relationship between beta and expected return, and it is the Security Market Line.

Figure 1: Relationship between beta and expected return



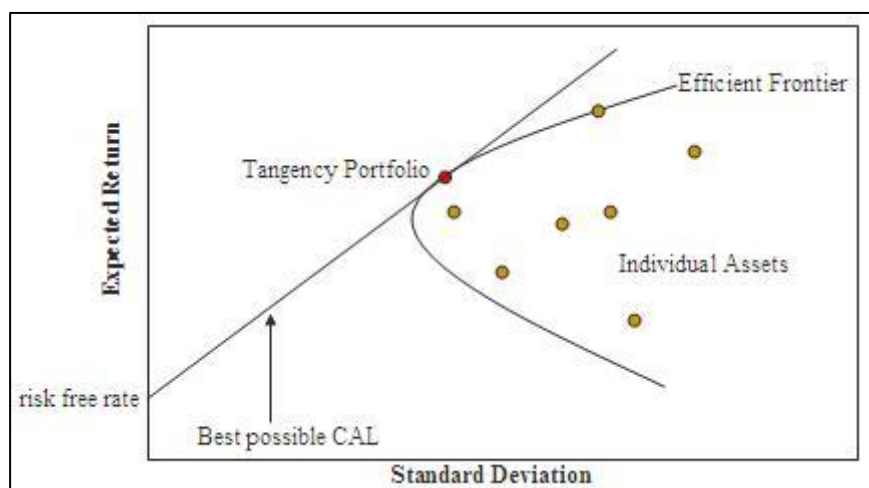
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CAPM can be used to evaluate active fund manager performance as it builds on the model of portfolio choice developed by Harry Markowitz (1959). It assumes that the risk-return profile of a portfolio can be optimised i.e. an optimal portfolio displays the lowest possible level of risk for its level of return. It is the set of portfolios each with the

feature that no other portfolio exists with a higher expected return but with the same standard deviation of return. The optimal portfolio must comprise every asset, with each asset value-weighted to achieve the above. All such optimal portfolios, i.e., one for each level of return, comprise the efficient frontier.

Because remaining risk, which is unsystematic risk is diversifiable, the total risk of a portfolio which the market will price, can be measured as beta. Figure 2 describes the portfolio opportunities and the CAPM model. The diagram is taken from the Wikipedia website.

Figure 2: Portfolio opportunities and the CAPM model



Criticism of the CAPM has emerged over time and the empirical record is poor. There is evidence that market return alone is not sufficient to describe expected return, and there are other variables. A list follows.

Market capitalization by Banz (1981). He finds that the shares of firms with large market capitalization have lower average return than low market capitalization stock and large firms tend to have lower return even after controlling Earning /Price ratio.

Leverage by Bhandari (1988). He included leverage as a function of average return as high leverage will increase the riskiness of firm equity and beta coefficient.

The book-to-market ratio by Chan, Hamao and Lakonishok (1991). They find that book to market equity has a direct impact on the relationship with expected return.

Winner/Loser stock by DeBondt and Thaler (1985). They find that stocks that had a good return over the past three to five years have much lower average returns than 'losers' over the next three to five years.

Momentum by Jegadeesh (1990, 1993) and Titman (1993). They find that stock return exhibits a short-term momentum, and momentum is strong for firms with poor recent performance.

There is a study on CAPM anomalies in New Zealand by Gillan (1990). Gillian investigates the price-earning (P/E) ratio and small firm effects on the New Zealand Stock Exchange (NZSE). He applies the method developed by Banz (1981) and Reinganum (1981), to 200 securities on the NZSE over the period of 1977 to 1984. He found evidence for a small firm effect, but not for a P/E effect on the NZSE.

2.1.2 Three factor model

In contrast with the CAPM that uses only one variable to explain return on stocks, Fama and French (1992) propose a model which controls size and book-to-market ratio as well as beta. They used three variables to describe the return on stocks. It starts with the observation that two classes of stocks do better than the market, i.e. Small Caps stock and stocks with a low Price-to-Book ratios, and then adds these two factors to the CAPM. This three factor model explains portfolios of returns better than the one factor CAPM.

The new factors are calculated with combinations of portfolios composed by ranking stocks available from historical market data. In summary, the Fama-French three-factor model viewed both size and value as risk factors, for which one is rewarded with extra return.

2.1.3 Arbitrage Pricing theory

The Arbitrage Pricing Theory (APT) was developed by Ross (1976). It offers a testable alternative to the CAPM. It hypothesises that stock return is affected by a range of exogenous variables. It is influenced by systematic risk in the economy which affects all stocks to some degree. APT includes multiple factors that represent the fundamental risks in asset return and thus the prices of securities.

The APT is derived under the usual assumption of a perfectly competitive and frictionless capital market. In equilibrium all portfolios that can be selected from among the set of assets under consideration and that satisfy the condition of using no wealth and having no risk, must earn no return on average. These portfolios are called arbitrage portfolios.

Kazi M.H. (2008) applied APT on six *a priori* proxy variables to identify the systematic risk factors for the Australian stock market. Initially, 15 relevant macro-variables were considered to be the proxy. Through a variable selection process, the initial fifteen variables were reduced to six. Although not all variables are significantly influential, the linear combination of these six variables is observed to be cointegrated. He found that in the long-run 5 variables: bank interest rate, dividend yield, corporate profitability, industrial production and global market movements significantly influence the Australia stock market returns, but in the short-run it will be affected by only 3 variables: its own performance, interest rates and global stock market movements.

2.2 Economic factors

An effect on asset prices might be present in an economy with a dominant resource, such as oil or a commodity. Oil is a common example.

2.2.1 Oil effect

Over recent years, the impact and role of oil on stock prices and the financial market have been studied, among other variables, by a number of researchers. Bopp & Lady (1991), Farmer (1993), Moosa & Al-Loughani (1994), and Foster (1996), have analysed how forward and future prices effect oil related contracts. Strong (1991) examined how investors use oil equity portfolios to hedge the risk of oil price. Chen, Roll and Ross (1986), Hamao (1989), Al-Mudhaf and Goodwin (1993), Kaneko and Lee (1995), and Jones and Kaul (1996) investigated whether oil price has an influence in determining the price of equities in U.S, Canada, Japan and U.K markets.

Chen *et al.* implemented a multi-factor asset pricing model test using a macroeconomic set of variables and including the possibility that return series from oil prices could constitute an economic pricing factor. They found no evidence in a sample of U.S. equities to suggest that such a factor exists. Hamao applying the same approach as Chen *et al.* to the Japanese market, obtained a similar result.

However, Kaneko and Lee discovered that an oil price change factor is important in a recent sample of Japanese equity data. Jones and Kaul is a most comprehensive study on the impact of oil price changes in Canada, Japan, the U.K and U.S. They found that oil price changes have an unfavourable effect on output and real stock returns in all the four countries.

2.3 Milk as an additional factor

Milk is an important commodity in the New Zealand economy and is a possible additional economic factor for an asset pricing model. The role of Fonterra which is a co-operative owned by around 14,500 New Zealand dairy farmers, is also significant. Until 2003 when the Fonterra Shareholders' Fund was created, investors could not include the exposure to dairy prices directly in their portfolios. One of the assumptions of the CAPM model is that investments are publicly traded assets; i.e. all assets are perfectly marketable (liquid). The dairy assets of the New Zealand farmers were not liquid and not part of the investment set in the CAPM. Mayers (1972, 1973) treated the similar issue of personal capital. He extended the CAPM for the case where there are two kinds of assets: marketable (perfectly liquid) and nonmarketable (perfectly

nonliquid). The extended model shows that the linear form of the risk-expected return relationship is similar to the original CAPM model, but an asset's beta now depends on the covariance with non-marketable assets as well as with the market index. Fama and Schwert (1977) reviewed Mayers (1973) extended model and argued that the effect on the risk measure beta will be small for the case of human capital and not have important effects. However, the effect for a significant asset like milk might be different. This is an empirical issue which motivates the present study.

Many researchers have continuing interest in studying the role and impact of oil and other commodities on the financial market and stock prices. To my knowledge, there has been no research in studying the role of milk.

Chapter Three:

Milk, Fonterra and the

New Zealand Economy

3. Milk, Fonterra and the New Zealand Economy

3.1 Introduction

Since the early 1800s, the New Zealand dairy industry has gone from farmers keeping a few domestic cows in the bush to being a world leader (Hugh and Frank,2012). In 2009, the New Zealand dairy industry had export sales of more than NZD13.7 billion making it a leading export earner and selling 95% of its dairy products abroad, which is a greater proportion than any other country (Dairying Today,2015). As at 2015 New Zealand is one of the major exporters of whole milk powder (WMP) capturing almost 65% of the world market. (IndexMundi,2016).

The dairy industry has always played a significant role in the New Zealand economy. It had contributed an amount of NZD18.1 billion in 2014, being 25% of New Zealand export earnings. It has fed more than 100 million people worldwide. It represents approximately one-third of international dairy trade each year.

In New Zealand farmers receive no subsidies, which has encouraged a focus on low-cost, high productivity farming system. The dairy processing facilities in New Zealand are mostly co-operatively-owned by farmers, with the main co-operatives being Fonterra, Westland and Tatua.

3.2 Fonterra

The first co-operative company in New Zealand was established in Otago in 1871, to benefit from the pooled resources. By 1930s most dairy factories in New Zealand were owned by co-operatives, and more than 400 begin selling their products overseas; however this became difficult, so in 1923 to control all dairy exports the New Zealand government established the Dairy Export Produce Control Board.

With the Dairy Board, farmers are able to access new markets and able to gain better returns for their production, and make the milk industry grow and prosper. As a result, to become more efficient, aided by improved technologies in transport and

refrigeration, co-operatives began joining forces. By the 1960s, a total of 400 co-operatives had merged to 168 co-operatives.

In the 1960s, the New Zealand Milk industry started to diversify their markets and product ranges. By the 1980s they had 19 overseas subsidiaries and associated companies. In 1995 it had increased to 80. The New Zealand Dairy Board became the world's largest dedicated dairy marketing network.

In 1996, the industry then consolidated further to only 12 dairy companies. When the Government transferred the Dairy Board's assets to them, the competing dairy co-operatives were forced to work together for the first time. By the end of 2000, two major companies - New Zealand Dairy Group and Kiwi Co-operative Dairies - represented more than 95 percent of the industry. Two smaller co-operatives, Westland and Tatua, held the remaining 5 per cent.

In 2001, the two largest co-operatives, New Zealand Dairy Group and Kiwi Co-operative, merged to form Fonterra. It is a leading multinational dairy company, owned by around 14,500 New Zealand dairy farmers and is responsible for approximately 30% of world dairy exports and it is the world's largest exporter of dairy products. The Fonterra Group's global supply chain stretches from Fonterra's shareholders' farms in New Zealand through to consumers in more than 100 countries and markets over 2 million tonnes of product annually. This makes the Fonterra Group the world's leader in large scale milk procurement, processing and management, with some of the world's best-known dairy brands including Anchor, Anlene and Anmum.

As a co-operative, Fonterra is owned and controlled by the co-op members that use its services and share equally the earnings of the business. In order to be Fonterra shareholders, farmers have to supply milk to the company in New Zealand. Fonterra shareholders hold one share for each kilogramme of milk solids they supply to the co-operative, with the exception of a limited number of shareholders supplying milk under contract arrangements.

There are two different types of shares at Fonterra, The Fonterra Shareholders' Market and The Fonterra Shareholders' Fund.

The Fonterra Shareholders' Market (FSM) is a private market. Only Fonterra, Fonterra farmer shareholders, and an appointed market maker (known as the Register Volume Provider or RVP) are allowed to trade Fonterra shares. The FSM forms part of Trading Among Farmers (TAF), Introduced in late 2012 where Farmer Shareholders can buy and sell Shares among themselves, not with Fonterra.

Before late 2012 farmers could buy and sell shares directly from Fonterra. Fonterra had to issue shares to farmer shareholders when milk production increased, and was obliged to take them back (or redeem them) if the farmer shareholder stopped supplying milk to Fonterra, or their milk production decreased.

Fonterra's obligation to redeem shares exposed it to the risk that it may have to pay large sums of money to farmer shareholders who stopped or reduced their supply of milk to Fonterra (redemption risk).

Trading Among Farmers is designed to remove this redemption risk for Fonterra, and provide Fonterra with a stable capital base.

3.2.1 Trading Among Farmers

Trading Among Farmers has two functions.

Firstly, it is a series of inter-related arrangements that enable farmer shareholders to trade shares between themselves in the Fonterra Shareholders' Market, instead of Fonterra being required to issue and redeem shares,

Secondly, it enables outside investors, who are not allowed to hold shares in Fonterra, to invest in a security (a unit in the Fonterra Shareholders' Fund) that gives them access to the economic rights that they would have received if they were allowed to own a share.

3.2.1.1 The Fonterra Shareholders' Fund (FSF)

The fund is intended to supplement liquidity in the Fonterra Shareholders' Market through a liquid market for units which can be exchanged for shares in the FSM.

FSF is a unit trust formed under the Unit Trusts Act. It is managed by a Manager and has a Trustee. Units can be exchanged for shares of FSM (and vice versa) by Farmer Shareholders, Fonterra and the Registered Volume Provider on a one-for-one basis. Other investors cannot exchange units for shares in FSM. Units of FSF are listed on the NZX Main Board and on the ASX and can be freely bought and sold, in the same way as any other listed security.

3.2.1.2 Fonterra Shareholders' Market (FSM)

The Fonterra Shareholders' Market is operated by the NZX. It is regulated and monitored by NZX and the Financial Markets Authority, in the same way as other markets are operated by NZX. Farmer shareholders, Fonterra and the Registered Volume Provider (RVP) can buy or sell shares in the Fonterra Shareholders' Market, and buy or sell units of FSF on the NZX Main Board or ASX. They can effectively exchange shares of FSM for units of FSF and vice versa and therefore can shift between the two markets. The intended result is that shares (FSM) and units (FSF) should trade at very similar prices. This is referred to as the convergence of prices for shares and units. Although there are two separate markets, they have been designed to work together.

3.3 Other Co-operatives

3.3.1 Westland Co-operative Dairy Company Limited.

Westland is an independent co-operative dairy company in New Zealand, owned by over 425 farmer shareholders that supply milk for processing locally. In 2001, following the deregulation of the New Zealand dairy industry Westland Milk Products shareholders voted not to join Fonterra and remain independent.

Westland sourced their milk from farms as far as Karamea in the north and as far as Haast to the south of the West Coast and from farms throughout Canterbury. Their major processing factory is located in the town of Hokitika, and their main milk concentration plant and warehouse located near the small town of Rolleston outside Christchurch.

3.3.2 Tatua Co-operative Dairy Company

Tatua is an independent small co-operative dairy company in the small rural locality of Tātuanui in the North Island of New Zealand. Tatua co-operative is owned by 112 farmer shareholders, all within a 12-kilometre radius of the processing factory.

The co-operative has maintained a strong independence by becoming the only New Zealand dairy co-operative that remains and has never been part of any merger throughout its history

In the 2001 mega-merger for the New Zealand dairy industry - which formed Fonterra - Tatua shareholders decided to remain independent. Tatua, despite being the smallest dairy company in New Zealand, often records the highest payout for milk solids to its farmer shareholders, one of the main factors why Tatua decided to remain independent. Their high pay-out is mainly due to their focus on value-added milk products as compared to the traditional, mass-produced, of commodity-based milk products such as milk powder, butter and cheese. It is also due to a small catchment area which reduces processing costs.

3.4 Milk today

The increases in the global supply of milk, coupled with a relatively static demand of milk and dairy products, has seen average dairy prices fall around 50% since early 2014. The price fall affects the incomes of farmers and the New Zealand economy as well. The falling of dairy export has a direct impact on the economy by affecting the dairy manufacturers and farmers. Dairy manufacturers receive less income from export sales and, therefore, reduce incomes to farmers by reducing the farm gate prices. These falling incomes will reduce consumption by the farmer in rural areas, and the farm will try to reduce operational and capital expenses which will reduce revenue and profits of companies that supply the dairy sector. Overall the reduced incomes will eventually translate into lower spending and investment throughout the economy.

Chapter Four:

Methodology

4. Methodology

4.1 Cointegration Analysis

The study first investigates the relationship between the market index and milk prices measured in NZD. The NZX50 is used as the market index. The two series, the market index and milk prices, are tested for cointegration over the period December 2004 to January 2016. The logarithms of the series are used. They are first tested and found to be random walks, integrated of order one. Such series are cointegrated when there is a long-run linear relationship between them. If there is a linear relationship the difference between the series is not a random walk, but reverts to a common trend. On the other hand if the market index and milk prices are cointegrated then they are a common factor. Milk would not be an additional risk factor that general investors in New Zealand are exposed to in addition to other market risks.

A Granger causality test is also conducted to investigate the impact that changes in milk prices have on the stock index. If the market index and milk prices are not cointegrated it is still possible that milk prices influence the index: milk price might have a partial or delayed effect.

4.2 CAPM market model

After the cointegration analysis, a market model is fitted for all NZX companies, individually. This model regresses the monthly return for each company on the market index and the milk price variable over the period January 2005 to December 2012

$$r_a = \alpha + \beta_a r_M + \gamma r_P + \varepsilon \quad (3)$$

where

r_a is the return on asset a,

r_M is the return on the market index,

and r_P is the log ratio of the monthly milk price variable, $\ln(P_t/P_{t-1})$.

This period lies completely in the time before Fonterra Shareholder Fund (FSF) shares were introduced. It is kept short as parameters like beta will change over time.

There are two reasons why Equation (3) is fitted to companies individually, rather than to portfolios of companies as is done by, for instance, Fama and French (1996) and Gillan (1990). Firstly, milk price is not a factor that varies from one company to the next. In each month the milk price variable takes the same value for every company. Forming portfolios of companies would not help isolating a milk price effect. The second reason for fitting Equation (3) to companies individually, is that it allows the market beta to vary from one company to the next. In this way, the various factors like the size effect and the book-to-market effect, which have been found to be risk factors, are taken into account.

The specification of Equation (3) starts with the capital asset pricing model (CAPM). In the CAPM the expected return on a security depends on the sensitivity of its return to the market return.

$$E(r_a) = r_f + \beta_a(E(r_M) - r_f) \quad (4)$$

where

r_f is the Risk free rate,

β_a is the Beta of the security,

and r_M is the market return.

In New Zealand over the period 2005 to 2012 there are two different groups of investors. Firstly there are farmer investors who can invest in any shares traded on the NZX, and also shares in Fonterra. Secondly, other investors (non-farmer) who can trade in shares listed on the main board only. Until 2013 these investors could not include exposure to dairy prices directly in their portfolios.

The situation is like looking at the return on non-marketable human capital that is held by an individual. This issue has been explored by Mayers (1972). Mayers extends the two-parameter model of CAPM to include nonmarketable assets such as human capital. The New Zealand dairy farmers are like an individual with a non-marketable

asset. Mayers shows that when an investor is constrained to hold non-marketable assets that have risky rates of return (r_H) the CAPM take the following form:

$$E(r_a) = r_f + \lambda[V_M \text{cov}(r_a, r_M) + \text{cov}(r_a, r_H)] \quad (5)$$

Where

$$\lambda = \frac{E(r_M) - r_f}{V_M \sigma_M^2 + \text{cov}(r_M, r_H)} \quad (6)$$

V_M is the current value of all marketable assets,
and r_H is the total return on all nonmarketable assets.

In the above formula covariance is still the measure of risk but we now need to consider the covariance between an asset a and the non-marketable asset as well as with the market index. The log ratio of milk prices is like r_H the return on dairy assets. If the return on another marketable asset r_a is more sensitive to milk prices than the market return r_M is, then its beta will be larger than the usual CAPM. If the return on another marketable asset is less sensitive to milk prices than the market return is, then its beta will be smaller than the usual CAPM.

The relationship between an asset and the milk price will be the source in determining the sign of the coefficient of the milk price variable in Equation (3). An asset which is more sensitive to milk prices than the market return is will result in a positive sign for γ in Equation (3). An asset which is less sensitive will give a negative sign for γ .

4.3 The period since 2013

As Fonterra Shareholder Fund (FSF) shares were only listed in January 2013, whereas prior to being listed farmers could only trade their milk shares among themselves, the market model is fitted for the period since 2013 separately and a Chow test conducted

to investigate if there is any difference in coefficients between the two periods. While a different reaction before and after Fonterra shares were listed is an interesting question, it is noted that the period since 2013 is very short, and the test will not be very powerful.

Chapter Five:

Data

5. Data

5.1 Milk prices

Monthly milk prices were download from Global Dairy Trade, an auction platform set up by Fonterra to trade commodity dairy products. The Oceania milk power price was used which is representative of Fonterra's price (Understanding Dairy Markets (2016), International Dairy Product Prices).

The price is quoted in USD. It was converted to NZD using the exchange rate downloaded from the Reserve Bank of New Zealand.

5.2 The Market index

The NZX50 is used as the market index. Monthly observations were downloaded from Yahoo Finance.

5.3 Company returns

Prices for company stocks were downloaded from Yahoo Finance. There were 116 companies with sufficient data for analysis over the period analysed. These are listed in Table 1. Companies were categorised by industry based on information from PwC Appreciating Value New Zealand, March 2015. The industries are also indicated in Table 1. Company returns were measured as the log-ratio of prices, $\ln(P_t/P_{t-1})$.

Table 1: Companies Categorised by Industry			
Agriculture	Health care		Retail
A2 Milk	EBOS Group	SmartMIDZ	Hallenstein Glasson Hdg
Sanford	Fisher & Paykel Hlthcr	Marlin Global Limited	Michael Hill Intl
Allied Farmers Limited	Metlifecare	Smart MOZY	Restaurant Brands NZ
Fonterra Shareholder	Pacific Edge Ltd	SmartOZZY	Warehouse Group
PGG Wrightson Limited	Ryman Healthcare	Rubicon Limited Ordina	Briscoe Group Limited
Seeka Kiwifruit Indust	Abano Healthcare Group	The City of London Ind	The Colonial Motor Cor
T&G Global Limited Ord	BLIS Technologies Limi	SmartTENZ	Kathmandu Holdings Lim
	Green Cross Health Lim	Veritas Investments	Kircaldie & Stains
Construction			
Fletcher Building	Indusrial Prodn	Media telecom	Pacific Brands Limited
Nuplex Industries	Skellerup Holdings	Sky Network Television	Pumpkin Patch Limited
Steel And Tube Holdings	Mercer Group Limited	Spark New Zealand	Smiths City Group Limi
Downer EDI Limited Ord	Methven Limited Ordina	APN News & Media Limit	Services
Tenon Limited Ordinary	Scott Technology Limit	Telstra Corporation	AWF Madison Group Limi
	Sealegs Corporation	TeamTalk Limited Ordin	Cleanaway Waste Manage
Consumer			
Cavalier Corporation	Wellington Drive Techn		Opus International Cor
Comvita Limited Ordina		Mining	Trade Me Group Limited
Delegat Group Limited	Information Tech	New Talisman Gold Mi	TRS Investments Limite
Promisia Integrative	Finzsoft Solutions Lim	New Zealand Oil & Gas	Tourism leisure
SeaDragon Limited Ordi	Rakon Limited Ordinary	OceanaGold Corporation	Sky City Entm Gp
Trilogy International	Smartpay Holdings Limi	Pan Pacific Petroleum	Millennium & Copthor
	Templeton Emerging M		Tourism Holdings Limit
	VMob Group Limited Ord	Ports	
Financial			
ANZ Banking Group	Xero Limited Ordinary	Auckland Intl Airport	Transport
NZX		Port Of Tauranga	Air New Zealand
Tower	Investment	Marsden Maritime Holdi	Freightways
Westpac Banking Corp NZ	Coats Group	South Port New Zealand	Mainfreight
AMP Limited Ordinary	Hellaby Holdings		
ASB Capital Limited	Infratil	Property	Utilities
Heartland Bank Limited	Australian Foundation	Argosy Property	Contact Energy
Pyne Gould Corporation	Aorere Resources Limit	Goodman Property Trust	New Zealand Refining
Turners Limited Ordina	Bethunes Investments	Kiwi Property Group	Trustpower
	The Bankers Investment	Precinct Properties NZ	Vector Ltd
	Barramundi Limited O	Property For Industry	Chorus Limited (NS)
	SmartFONZ	Vital Healthcare Pr Tst	
	Henderson Far East Ind	Augusta Capital Limite	
	JPMorgan Japanese Indu	CDL Investments New	
	Kingfish Limited Ordin	NPT Limited Ordinary	

Chapter Six:

Results

6. Results

6.1 Cointegration Analysis

This section reports the results of the cointegration analysis performed on the two series, the NZX50 and milk prices measured in NZD. The logarithms of both series were used. Cointegration exists when there is a long-run linear relationship between two series both integrated of the same order, one. An augmented Dickey–Fuller test (ADF) developed by Dickey and Fuller (1979, 1981) is used to test whether they have unit roots. The augmented Dickey–Fuller (ADF) statistic, used in this test, is a negative number. The more negative it is, the stronger the rejection of the hypothesis that there is a unit root at some level of confidence. The statistical output of the tests are contained in Appendix 1, and the results summarised in Table 2.

Table 2: ADF test for unit roots

	Z value	5% Critical value
NZX50	-1.751	-3.446
Milk Price in NZD	-2.279	-3.446

From the table, it is seen that both NZX50 and Milk prices have Z values higher than the 5% Critical value. The tests fail to reject null hypotheses of unit roots. So NZX50 and Milk prices are each not stationary, and the conclusion is that they are integrated of order one. The series might be cointegrated.

To test whether the series are cointegrated the procedure in Engle and Granger (1987) is followed. The logarithm of the market index is regressed on the logarithm of the milk price variable and the residuals tested for stationarity using the ADF test. If the residuals have a unit root they are not stationary and the conclusion is that the two series are not cointegrated. The results from this procedure are in Appendix 2 and the unit root test on the residuals is summarised in Table 3.

Table 3: ADF test for unit root on residuals from regressing log NZX50 on log milk price

	Z value	5% Critical value
Residuals	-2.494	-2.888

Since the Z value is bigger than the 5% critical value the null hypothesis cannot be rejected at this level. I conclude that the residual has a unit root and is not stationary and therefore that the NZX50 and milk prices are not cointegrated. This supports the conclusion that milk price has an independent stochastic trend and could be an additional risk factor besides market risk.

6.1.1 Granger Causality test

Since the market index and milk price variable are not cointegrated, they are not linearly related in the long-run. The milk price variable might still be a leading variable for the market index. A Granger Causality test was conducted to investigate this for three periods: 2005-2012, 2013-2015 and for the combined period 2005-2015. Monthly observations and the logarithms of data were used, and the variables each lagged to four periods. The statistical output is in Appendix 3, and summarised in Table 4. It is noted that four observations are lost in each fit due to lagging four periods.

Table 4: Results of Granger Causality tests.

Period	2005-2012	92 obsns	P = 0.0355
	2013-2015	33 obsns	P= 0.5857
Combined	2005-2015	129 obsns	P= 0.0811

In each case, the null hypothesis is that the coefficients of the four lags of the milk price variable are jointly zero.

The null hypothesis is rejected at the 5% level of significance for the first period, 2005-2012. There is evidence that milk prices Granger-cause market return over this period. Some milk price risk is priced by the market index, with a lagged effect.

It is interesting that the null hypothesis cannot be rejected for the second period, 2013-2015. This period is very short, and the test, therefore, does not have much power. When the two periods are combined, the null hypothesis cannot be rejected at the 5% level of significance. There is some evidence that the relationship between the market index and milk prices has changed with the introduction of Fonterra Shareholder Fund (FSF) shares to the NZX.

6.2 CAPM market model January 2005 to December 2012

6.2.1 Estimates of milk price coefficients

The results from fitting Equation (3) on page 28 to 115 companies on the NZX using monthly return from January 2005 to December 2012 are presented in Appendix 4. Not all these companies were present for the whole period, but were fitted for the period they were available. The main variable of interest is the estimated coefficient of the milk variable. This is summarised in Table 5, and the cases where the coefficient is significantly different from zero are listed in table 6, it shows that all the estimated coefficients were small. The range was -0.475 to 0.342.

Table 5: Milk coefficient estimated over 2005 to 2012

	Negative	Positive
Milk coefficient	58 Cases	57 Cases
Significant at:		
5% level	2 Cases	5 Cases
10% level	6 Cases	6 Cases

Table 6: Companies with significant milk coefficients

		Company	Industry	Coef.	t
Positive at	5% level	Fletcher Building	Construction	0.156	2.298
		Sanford	Agriculture	0.158	2.395
		JPMorgan Japanese	Investment	0.342	2.027
		Kircaldie & Stains	Retail	0.172	2.601
		Opus Int. Corb.	Services	0.196	2.043
	10% level	Henderson Far East	Investment	0.353	1.742
Negative at	5% level	Spark New Zealand	Telecom	-0.200	-2.428
		Pan Pacific Petroleum	Mining	-0.475	-2.550
	10% level	Air New Zealand	Transport	-0.215	-1.894
		EBOS Group	Healthcare	-0.111	-1.893
		Kiwi Property Group	Property	-0.089	-1.940
		Green Cross Health	Healthcare	-0.367	-1.813

The number of significant cases is not much different from random in 115 fits. However for many companies the economic effect of milk prices would be very small and statistical significance from zero would not be expected anyway. Some significant cases might be explained using Mayers' extension to the CAPM. For example, Fletcher Building has a positive milk coefficient with $t=2.298$. Farmers' building activity might be more sensitive to dairy farmer incomes than other investors'. The EBOS milk coefficient is negative with $t=-1.893$. This company has interests in animal care. Animal costs might be fixed and farmers' activity less sensitive to dairy farmer incomes than others investors'.

6.2.2 Patterns in milk price coefficients

The study also looked for patterns in the estimated milk coefficients. According to Fisher:

The most impressive kind of econometric result is not that of goodness of fit but that of a striking and plausible pattern in the point estimates obtained by treating similar problems in a similar way. (Fisher, 1962)

The estimated coefficients were regressed on dummy variables for the 17 industry groupings in Table 1. Because the coefficients are estimated, weighted least squares was used. The reciprocals of standard errors of the estimated milk coefficients were used for weights so that companies with large standard errors have smaller influences on the results. The results are presented in table 7.

Table 7: Regression of milk coefficients on industry groupings, 2005-2012		
Industry	Effect	t
Agriculture	0.100	2.043
Construction	0.067	1.334
Consumer	0.117	1.613
Financial	-0.014	-0.404
Health Care	-0.053	-1.327
Industrial Prodn	0.048	0.829
Information Tech	-0.024	-0.380
Investment	0.001	0.059
Media telecom	-0.077	-2.061
Mining	-0.071	-0.762
Ports	0.030	0.771
Property	-0.051	-2.519
Retail	0.036	1.196
Services	0.104	1.282
Tourism Leisure	0.029	0.570
Transport	-0.036	-0.804
Utilities	-0.011	-0.347
R-Squared=0.217		P=0.059

There is a plausible Pattern. The regression is significant at the 10% level, and almost at the 5% level. Industries where there would be an elastic income effect, such as Construction, Consumer, Retail and Services have positive effects. Industries where income effects are probability inelastic, such as Financial, HealthCare, Media, Property, Transport and Utilities have negative effects.

6.2.3 Size of milk price effect

To assess the economic significance of a milk effect, it is necessary to go back to Mayers' CAPM formula given in Equations (5) and (6) on page 30. Mayers' formula gives an adjustment to the quantity of risk given by the usual CAPM beta. The adjustment depends on the current value of all marketable assets, V_M and the total return to dairy farmers (all non-marketable assets), r_H . Estimating r_H/V_M by the contribution to NZ GDP which is about 2.8% (Stuff, 2011), the adjustment to the usual CAPM beta is calculated for a range of parameters for the first period in Table 8.

Table 8: Estimated adjustment to be the usual CAPM beta, 2005-2012

	Milk Coefficient, σ	
	-0.3	0.3
$\beta = 0.8$	-0.033	0.029
$\beta = 1.5$	-0.035	0.028

For typical values observed for beta and the milk coefficient the adjustment is in all cases less than four percentage points. This is consistent with Fama's and Schwert's (1977) observation that "the model that includes human capital leads to estimates of risk for marketable assets indistinguishable from those of the simpler models."

6.3 The period since 2013

The results from fitting Equation (3) on page 28 to the period January 2013 to 1 April 2016 to 116 companies are presented in Appendix 5. These are the companies for which data was available for this period. The estimated coefficients of the milk variable are summarised in Table 9, and the cases with coefficients that are significantly different from zero are listed in Table 10.

Table 9: Companies with significant milk coefficients

		Company	Industry	Coef.	t
Positive at	5% level	EBOS Group	Healthcare	0.211	2.778
		Madison Group	Services	0.199	2.508
		Xero Limited	Information Technology	0.522	2.411
	10% level	Marsden Maritime	Ports	0.088	1.724
		SmartTENZ	Investment	0.026	1.727
Negative at	5% level	Smiths City Group	Retail	-0.133	-2.165
		Veritas Investments	Investment	-0.307	-1.968
	10% level	Tower	Financial	-0.213	-1.808
		Chorus Limited	Utilities	-0.280	-1.880
		Rakon Limited	Information Technology	-0.342	-1.914

Table 10: Milk coefficient estimated over 2013 to 2016

	Negative	Positive
Milk coefficient	64 Cases	52 Cases
Significant at:		
5% level	2 Cases	3 Cases
10% level	5 Cases	5 Cases

There is again some significant cases that might be expected at random in 116 regressions. However, a weighted regression of milk coefficients on industry groupings in Table 11, no longer has the patterns observed in Table 7 for the first period. Therefore there is some evidence that a change has taken place since 2013. However, because the second period is short, the tests here are not very powerful. In fact the Chow test to test constancy of the milk coefficients between the two periods found no significant differences in all cases where the companies were present in both periods.

Table 11: Regression of milk coefficients on industry groupings, 2013-2016		
Industry	Effect	t
Agriculture	0.003	0.081
Construction	-0.012	-1.069
Consumer	0.024	0.455
Financial	0.004	0.159
Health Care	0.030	0.978
Industrial Prodn	0.054	1.130
Information Tech	-0.075	-1.293
Investment	0.012	1.456
Media telecom	-0.034	-0.876
Mining	-0.093	-1.507
Ports	0.039	1.588
Property	0.021	1.504
Retail	-0.016	-0.730
Services	0.030	0.720
Tourism Leisure	-0.023	-0.494
Transport	-0.033	-0.915
Utilities	-0.032	-1.072
R-Squared=0.156		P=0.324

Chapter Seven:

Conclusions

7.0 Conclusions

This study was motivated by the importance of milk prices to the New Zealand economy, and possible market imperfections due to the largest dairy company, Fonterra, being a cooperative. Before 2013 exposure to milk price risk mainly affected farmers. The study investigated whether milk price was an additional factor that investors in New Zealand are exposed to in addition to other market risks that are measured by the NZX50.

Some evidence of a small milk price effect was found over the period 2005 to 2012. There was also some evidence of a change when the Fonterra Shareholders' Fund was created in 2013, but there is insufficient data since 2013 for powerful statistical tests. Below are the findings to the four specific questions that were posed.

1. What are the characteristics that would make the risk of an asset greater or lower in the presence of milk price risk?

The study adopted Mayers' (1972) extension of the CAPM to nonmarketable assets. In Mayers' formula, the covariance is still the measure of risk, but we now need to consider the covariance with total return on nonmarketable assets. Applying Mayers' formula indicated that if the return on another marketable asset is more sensitive to milk prices than it is to the market return, its beta will be larger than the usual CAPM beta, and if the return on another marketable asset is less sensitive to milk prices than the average market return, its beta will be smaller than the usual CAPM.

2. Does milk price risk have an observable price in New Zealand, or is it completely diversified?

From the cointegration analysis reported in chapter 6.1, the conclusion is that milk price risk has not been completely diversified away. ADF tests supported the conclusion that the market index and the milk price variables are both integrated of order one, and from the Engle and Granger procedure the conclusion was that they are not cointegrated. Milk price has an independent stochastic trend. Milk price could be an additional risk factor beside market risk. Fitting the CAPM market model in chapter 6.2 to the period 2005-2012 showed several cases of significant coefficients for the milk

price variable. All the estimated coefficients were small. The range was -0.475 to 0.342. The adjustment to the usual CAPM beta was estimated to be less than four percentage points. The conclusion is that milk price risk did have an observable price over this period but that its economic significance is small.

3. Is there evidence of a milk price effect on assets in New Zealand?

Referring to chapter 6.2.2 on the study of patterns in milk price coefficients over the period 2005-2012 the results did show evidence of a milk price effect on assets. Industries where there would be an elastic income effect, such as Construction, Consumer, Retail, and Services have a positive milk price effect. Industries where income effects would be inelastic, such as Financial, HealthCare, Media, Property, Transport and Utilities have a negative milk price effect.

4. Is there evidence of a change in the effect of milk price risk following the change to Fonterra's capital structure in 2013?

There is evidence of a change in the milk price risk following the creation of the Fonterra Shareholders' Fund in 2013, though the small period available since 2013 limited the power of the statistical tests. A Granger Causality test conducted for three periods, 2005-2012, 2013-2015 and for the combined period 2005-2015, indicated that a causal relationship between the NZX50 and milk prices in the first period, changes. Also, the patterns by industry observed for the estimated milk price effects over 2005-2012, were not observed for the period 2013-2016.

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7.1 Future research

The period since the creation of the Fonterra Shareholders' Fund limited the power of the statistical tests in this study. Future research might investigate Granger Causality and fit the CAPM market model over a longer period since the change.

The milk price variable in this study was measured in NZD, whereas the original variable is measured in USD. Since the returns to dairy farmers come mainly from

overseas earnings, future research might investigate whether the effect found for milk prices might be influenced by the exchange rate.

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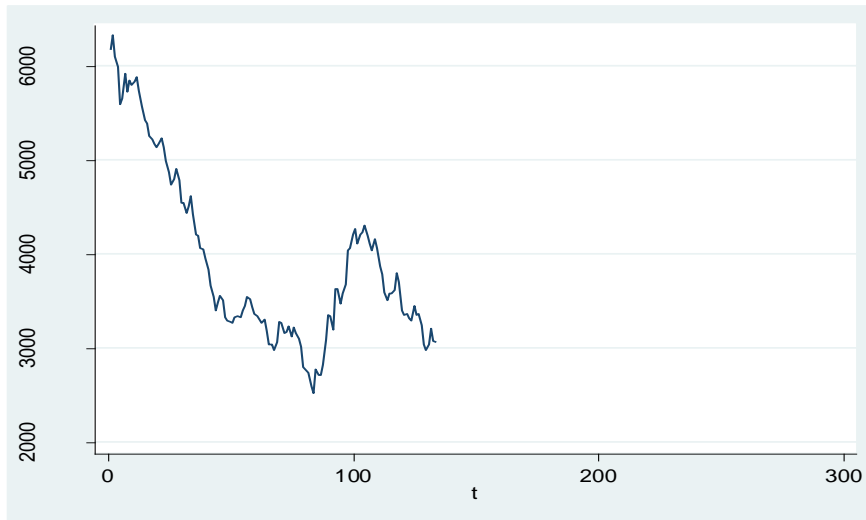
Appendices

Appendix 1

ADF test for unit roots

Unit Root Test

2005-2012



NZX50

```
. dfuller NZX50, trend regress lags(2)
```

Augmented Dickey-Fuller test for unit root Number of obs = 131

Test	Interpolated Dickey-Fuller			
	Statistic	1% Critical Value	5% Critical Value	10% Critical Value
Z(t)	-1.751	-4.030	-3.446	-3.146

MacKinnon approximate p-value for Z(t) = 0.7277

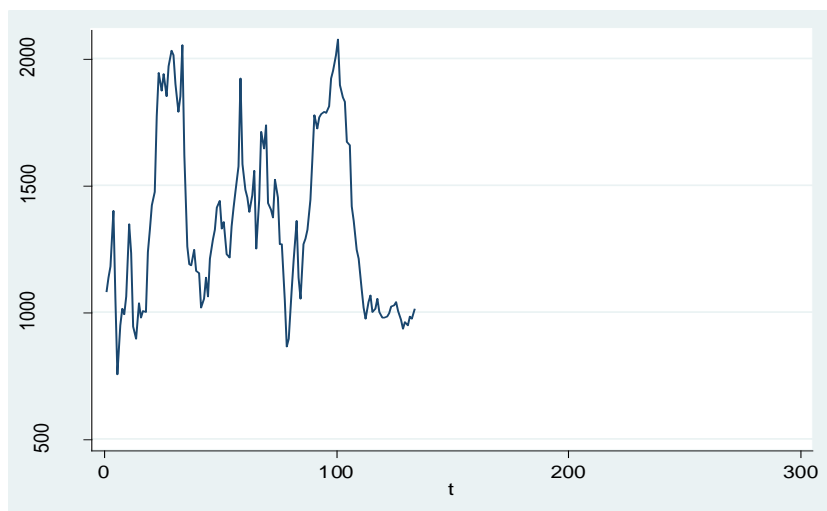
D.NZX50	Coef.	Std. Err.	t	P> t	[95% Conf. Interval]	
NZX50						
L1.	-.0289786	.0165451	-1.75	0.082	-.0617209	.0037638
LD.	.1354382	.0867317	1.56	0.121	-.0362012	.3070777
L2D.	-.0977104	.0863962	-1.13	0.260	-.268686	.0732651
_trend	-.0028653	.3995747	-0.01	0.994	-.793612	.7878814
_cons	91.08592	86.23359	1.06	0.293	-79.56782	261.7397

Z value (-1.751) > 5% Critical Value (-3.446)

Fail to reject H0

Has a unit root and it is not stationary

NZX50 = I (1)



Milk NZD

```
. dfuller MilkNZD, trend regress lags(2)
```

Augmented Dickey-Fuller test for unit root Number of obs = 131

Test Statistic	Interpolated Dickey-Fuller		
	1% Critical Value	5% Critical Value	10% Critical Value
Z(t)	-2.279	-4.030	-3.446

MacKinnon approximate p-value for Z(t) = 0.4456

D.MilkNZD	Coef.	Std. Err.	t	P> t	[95% Conf. Interval]	
MilkNZD						
L1.	-.0834785	.0366286	-2.28	0.024	-.1559655	-.0109916
L2.	.1423286	.0879072	1.62	0.108	-.0316371	.3162944
L2D.	-.1072559	.0885997	-1.21	0.228	-.2825921	.0680804
_trend	-.2580429	.3121071	-0.83	0.410	-.8756937	.3596079
_cons	129.3648	56.96251	2.27	0.025	16.63767	242.0919

Z value (-2.279) > 5% Critical Value (-3.446)

Fail to reject H0

Has a unit root and it is not stationary

Milk NZD = I (1)

Appendix 2

Unit Root test on Residuals

2005-2012

```
.
. regress NZX50 MilkNZD
```

Source	SS	df	MS	Number of obs	=	134
Model	205497.205	1	205497.205	F(1, 132)	=	0.23
Residual	117026145	132	886561.708	Prob > F	=	0.6310
				R-squared	=	0.0018
				Adj R-squared	=	-0.0058
Total	117231643	133	881440.922	Root MSE	=	941.57

NZX50	Coef.	Std. Err.	t	P> t	[95% Conf. Interval]	
MilkNZD	.1163806	.2417308	0.48	0.631	-.3617869	.594548
_cons	3768.54	335.7532	11.22	0.000	3104.387	4432.693

```
.
. //Residual test
. predict double resid, residuals
(138 missing values generated)
```

```
.
. //ADF resid
. dfuller resid
```

Dickey-Fuller test for unit root Number of obs = 133

Interpolated Dickey-Fuller				
Test Statistic	1% Critical Value	5% Critical Value	10% Critical Value	
Z(t)	-2.494	-3.499	-2.888	-2.578

Mackinnon approximate p-value for Z(t) = 0.1169

The Z value (-2.494) > 5% Critical Value (-2.888)

Fail to reject H0

Residual has a unit root

Series (NZX50 and Milk NZD) are Not Cointegrated

Appendix 3

Granger Causality test

4 lagged

2005-2012

```
. set more off
```

```
.
. gen time=_n
```

```
. tsset time
      time variable: time, 1 to 97
             delta: 1 unit
```

```
.
. //Do MilkNZD Granger-cause Marketreturn
. **regress Marketreturn L.Marketreturn L.MilkNZD
. regress Marketreturn L(1/4).Marketreturn L(1/4).MilkNZD
```

Source	SS	df	MS	Number of obs	=	92
				F(8, 83)	=	2.19
Model	.022555275	8	.002819409	Prob > F	=	0.0362
Residual	.106813256	83	.001286907	R-squared	=	0.1743
				Adj R-squared	=	0.0948
Total	.129368531	91	.001421632	Root MSE	=	.03587

Marketreturn	Coef.	Std. Err.	t	P> t	[95% Conf. Interval]	
Marketreturn						
L1.	.0791699	.1089651	0.73	0.470	-.1375573	.2958971
L2.	-.2045503	.1068104	-1.92	0.059	-.4169919	.0078913
L3.	.1316599	.1072658	1.23	0.223	-.0816875	.3450072
L4.	.0503281	.1058668	0.48	0.636	-.1602367	.260893
MilkNZD						
L1.	.0433989	.0533778	0.81	0.419	-.0627674	.1495653
L2.	.104827	.0545147	1.92	0.058	-.0036005	.2132546
L3.	.089821	.0551824	1.63	0.107	-.0199345	.1995765
L4.	.0462625	.0559154	0.83	0.410	-.0649511	.157476
_cons	.0009517	.0037773	0.25	0.802	-.0065612	.0084646

```
.
. **test L.MilkNZD
. test L1.MilkNZD L2.MilkNZD L3.MilkNZD L4.MilkNZD
```

```
( 1)  L.MilkNZD = 0
( 2)  L2.MilkNZD = 0
( 3)  L3.MilkNZD = 0
( 4)  L4.MilkNZD = 0
```

```
      F( 4, 83) = 2.71
      Prob > F = 0.0355
```

```
.
end of do-file
```

2013-2015

```
. set more off
```

```
.
. gen time=_n
```

```
. tsset time
      time variable: time, 1 to 38
             delta: 1 unit
```

```
.
. //Do MilkNZD Granger-cause Marketreturn
. **regress Marketreturn L.Marketreturn L.MilkNZD
. regress Marketreturn L(1/4).Marketreturn L(1/4).MilkNZD
```

Source	SS	df	MS	Number of obs	=	33
				F(8, 24)	=	1.59
Model	.0059216	8	.0007402	Prob > F	=	0.1809
Residual	.011189945	24	.000466248	R-squared	=	0.3461
				Adj R-squared	=	0.1281
Total	.017111545	32	.000534736	Root MSE	=	.02159

Marketreturn	Coef.	Std. Err.	t	P> t	[95% Conf. Interval]	
Marketreturn						
L1.	-.1627366	.1730625	-0.94	0.356	-.51992	.1944469
L2.	-.4389006	.1718179	-2.55	0.017	-.7935152	-.084286
L3.	-.1543161	.1679407	-0.92	0.367	-.5009287	.1922965
L4.	-.4353458	.1713257	-2.54	0.018	-.7889446	-.081747
MilkNZD						
L1.	.0178114	.0356773	0.50	0.622	-.0558229	.0914457
L2.	.0298207	.0349672	0.85	0.402	-.042348	.1019895
L3.	.0268894	.0319677	0.84	0.409	-.0390886	.0928674
L4.	.0400264	.0354256	1.13	0.270	-.0330885	.1131413
_cons	.0226619	.0057535	3.94	0.001	.0107872	.0345366

```
.
. **test L.MilkNZD
. test L1.MilkNZD L2.MilkNZD L3.MilkNZD L4.MilkNZD
```

```
( 1)  L.MilkNZD = 0
( 2)  L2.MilkNZD = 0
( 3)  L3.MilkNZD = 0
( 4)  L4.MilkNZD = 0
```

```
      F( 4, 24) =    0.72
      Prob > F =    0.5857
```

```
.
end of do-file
```

```
.
```


2005-2015

```
. set more off
```

```
.
```

```
. gen time=_n
```

```
. tsset time
```

```
    time variable: time, 1 to 134
```

```
    delta: 1 unit
```

```
.
```

```
. //Do MilkNZD Granger-cause Marketreturn
```

```
. **regress Marketreturn L.Marketreturn L.MilkNZD
```

```
. regress Marketreturn L(1/4).Marketreturn L(1/4).MilkNZD
```

Source	SS	df	MS	Number of obs	=	129
				F(8, 120)	=	2.10
Model	.018509527	8	.002313691	Prob > F	=	0.0407
Residual	.132143634	120	.001101197	R-squared	=	0.1229
				Adj R-squared	=	0.0644
Total	.150653161	128	.001176978	Root MSE	=	.03318

Marketreturn	Coef.	Std. Err.	t	P> t	[95% Conf. Interval]	
Marketreturn						
L1.	.1137083	.0903746	1.26	0.211	-.0652271	.2926437
L2.	-.1934952	.0894666	-2.16	0.033	-.3706328	-.0163575
L3.	.1306639	.0901435	1.45	0.150	-.0478139	.3091417
L4.	.019708	.0890694	0.22	0.825	-.1566433	.1960593
MilkNZD						
L1.	.0402016	.0355828	1.13	0.261	-.0302499	.1106531
L2.	.0602322	.0357189	1.69	0.094	-.0104888	.1309532
L3.	.0485517	.0343838	1.41	0.161	-.0195258	.1166292
L4.	.0347619	.0347604	1.00	0.319	-.0340612	.103585
_cons	.0039437	.0030487	1.29	0.198	-.0020925	.00998

```
.
```

```
. **test L.MilkNZD
```

```
. test L1.MilkNZD L2.MilkNZD L3.MilkNZD L4.MilkNZD
```

```
( 1) L.MilkNZD = 0
```

```
( 2) L2.MilkNZD = 0
```

```
( 3) L3.MilkNZD = 0
```

```
( 4) L4.MilkNZD = 0
```

```
F( 4, 120) = 2.13
```

```
Prob > F = 0.0811
```

```
.
```

```
end of do-file
```

```
.
```

Appendix 4

**Result from fitting the CAPM market model,
2005-2012**

Result from fitting the CAPM market model, 2005-2012

Beta	Constant	Beta	Milk Coef	P Value	# Of Obs
Auckland Intl Airport	0.005 (0.0050)	0.8619 (0.1363)	0.073 (0.0704)	0.000000	97
Air New Zealand	-0.0026 (0.0081)	1.3211 (0.2201)	-0.2152 (0.1136)	0.000000	97
ANZ Banking Group	0.0035 (0.0058)	0.7946 (0.1562)	-0.0913 (0.0806)	0.000011	97
Argosy Property	0.0089 (0.0058)	0.7493 (0.1819)	-0.0739 (0.0694)	0.000434	51
A2 Milk	-0.0018 (0.0234)	1.5649 (0.6344)	-0.3127 (0.3276)	0.044859	97
Contact Energy	-0.0021 (0.0043)	1.0429 (0.1170)	-0.0299 (0.0604)	0.000000	97
Coats Group	-0.0125 (0.0071)	1.4208 (0.1902)	0.0354 (0.0982)	0.000000	96
EBOS Group	0.0065 (0.0042)	0.7714 (0.1132)	-0.1107 (0.0585)	0.000000	97
Fletcher Building	0.0019 (0.0048)	1.3998 (0.1311)	0.1555 (0.0677)	0.000000	97
Fisher & Paykel Hlthcr	-0.0021 (0.0063)	0.5604 (0.1717)	0.0503 (0.0887)	0.004513	97
Freightways	0.004 (0.0043)	0.8204 (0.1159)	0.0025 (0.0599)	0.000000	97
Goodman Property Trust	0 (0.0048)	0.699 (0.1270)	-0.0883 (0.0603)	0.000002	72
Hellaby Holdings	-0.0092 (0.0123)	1.7965 (0.3334)	-0.2045 (0.1722)	0.000003	97
Hallenstein Glasson Hdg	0.0033 (0.0058)	1.0716 (0.1558)	-0.037 (0.0805)	0.000000	97
Infratil	0.0021 (0.0043)	1.1498 (0.1160)	0.036 (0.0599)	0.000000	97
Kiwi Property Group	0.0026 (0.0038)	0.6302 (0.1206)	-0.0893 (0.0460)	0.000006	51
Mainfreight	0.0158 (0.0065)	1.1284 (0.1761)	-0.0118 (0.0909)	0.000000	97
Metlifecare	-0.0029 (0.0082)	1.0466 (0.2216)	0.1183 (0.1144)	0.000018	97
Michael Hill Intl	0.0029 (0.0072)	1.0013 (0.1942)	0.0954 (0.1003)	0.000004	97
Nuplex Industries	-0.0151 (0.0137)	1.44 (0.3695)	0.0972 (0.1908)	0.000633	96

@ SE in parentheses.

continued

continued

Result from fitting the CAPM market model, 2005-2012

	Constant	Beta	Milk Coef	P Value	# Of Obs
NZX	0.0126 (0.0121)	1.1405 (0.3289)	0.1279 (0.1698)	0.002031	97
New Zealand Refining	0.01 (0.0133)	0.4685 (0.3605)	-0.0346 (0.1862)	0.438093	97
Precinct Properties NZ	0.0008 (0.0066)	0.3638 (0.1998)	-0.0709 (0.0819)	0.135375	48
Pacific Edge Ltd	0.0082 (0.0194)	0.1995 (0.5261)	0.119 (0.2717)	0.828413	97
Property For Industry	0.0059 (0.0030)	0.3015 (0.0818)	-0.0306 (0.0423)	0.001862	97
Port Of Tauranga	0.0085 (0.0049)	0.7382 (0.1335)	0.0312 (0.0690)	0.000001	97
Restaurant Brands NZ	0.0095 (0.0081)	0.6509 (0.2182)	-0.0489 (0.1127)	0.015091	97
Ryman Healthcare	0.0329 (0.0185)	1.2052 (0.5006)	0.1232 (0.2585)	0.04714	97
Sanford	0.0015 (0.0047)	0.388 (0.1276)	0.1578 (0.0659)	0.00044	97
Sky City Entm Gp	-0.0026 (0.0046)	1.1165 (0.1247)	-0.0092 (0.0644)	0.00000	97
Skellerup Holdings	0.0041 (0.0082)	1.1862 (0.2223)	-0.098 (0.1148)	0.000005	97
Sky Network Television	-0.0028 -0.0049	0.8581 -0.1322	-0.0569 -0.0683	0.000000	96
Spark New Zealand	-0.0078 (0.0059)	1.143 (0.1598)	-0.2004 (0.0825)	0.000000	97
Steel And Tube Holdings	-0.0081 (0.0067)	1.2335 (0.1820)	-0.1058 (0.0940)	0.000000	97
Trustpower	0.0046 (0.0033)	0.6196 (0.0896)	-0.0359 (0.0462)	0.000000	97
Tower	-0.0016 (0.0085)	0.9214 (0.2296)	0.0623 (0.1186)	0.000420	97
Vector Ltd	0.0004 -0.0055	0.5628 -0.1491	0.0925 -0.074	0.000444	89
Vital Healthcare Pr Tst	0.0089 (0.0054)	0.2743 (0.1716)	-0.0377 (0.0655)	0.243054	51
Westpac Banking Corp NZ	0.0047 (0.0061)	1.0389 (0.1657)	-0.053 (0.0855)	0.000000	97

@ SE in parentheses.

continued

continued

Result from fitting the CAPM market model, 2005-2012

	Constant	Beta	Milk Coef	P Value	# Of Obs
Warehouse Group	0.0008 (0.0081)	0.686 (0.2205)	-0.0247 (0.1138)	0.010492	97
Abano Healthcare Group	0.0169 (0.0088)	0.9738 (0.2386)	-0.1757 (0.1232)	0.000362	97
Australian Foundation	0.001 (0.0104)	0.7023 (0.2707)	-0.0712 (0.1476)	0.038138	58
Allied Farmers Limited	-0.0948 (0.0292)	1.3707 (0.7909)	-0.2117 (0.4084)	0.222653	97
AMP Limited Ordinary	-0.0035 (0.0058)	1.115 (0.1578)	-0.0911 (0.0815)	0.000000	97
Aorere Resources Limit	-0.005 (0.0208)	1.9796 (0.5741)	0.11 (0.3043)	0.002450	95
APN News & Media Limit	-0.029 (0.0113)	1.2305 (0.3054)	0.0493 (0.1577)	0.000467	97
ASB Capital Limited	-0.0024 (0.0070)	0.642 (0.1738)	0.092 (0.0932)	0.001043	55
Augusta Capital Limite	-0.0027 (0.0048)	0.8911 (0.1288)	-0.0143 (0.0604)	0.000000	73
AWF Madison Group Limi	0.0094 (0.0122)	0.1193 (0.3324)	-0.1601 (0.1651)	0.611116	90
Briscoe Group Limited	0.0087 (0.0060)	1.0466 (0.1617)	-0.0794 (0.0835)	0.000000	97
Bethunes Investments	0.0024 (0.0267)	0.6658 (0.6949)	0.4146 (0.3724)	0.304999	88
The Bankers Investment	0.0024 (0.0032)	0.8048 (0.0856)	-0.0256 (0.0442)	0.000000	97
BLIS Technologies Limi	-0.0188 (0.0224)	-0.4256 (0.6062)	0.1162 (0.3130)	0.753922	97
Barramundi Limited O	-0.0017 (0.0181)	0.8212 (0.4839)	-0.2689 (0.2269)	0.146553	75
Cavalier Corporation	-0.0103 (0.0095)	1.4479 (0.2580)	0.1103 (0.1332)	0.000001	97
CDL Investments New	0.0039 (0.0066)	0.6409 (0.1781)	-0.0398 (0.0920)	0.002517	97
The Colonial Motor Cor	0.0064 (0.0056)	0.2171 (0.1525)	0.0147 (0.0787)	0.348681	97
Chorus Limited (NS)	-0.0446 (0.0250)	2.1533 (0.8555)	-0.2534 (0.4065)	0.046094	14
Comvita Limited Ordina	0.0032 (0.0114)	0.996 (0.3073)	0.2444 (0.1587)	0.001388	97
Cleanaway Waste Manage	-0.088 (0.6060)	14.7374 (15.8868)	6.8065 (9.9478)	0.487232	37

@ SE in parentheses.

continued

continued

Result from fitting the CAPM market model, 2005-2012

	Constant	Beta	Milk Coef	P Value	# Of Obs
Delegat Group Limited	0.0032 (0.0096)	0.3612 (0.2566)	0.206 (0.1259)	0.081094	84
Downer EDI Limited Ord	-0.0009 (0.0720)	0.5654 (1.8099)	0.4752 (0.9432)	0.825477	73
Finzsoft Solutions Lim	-0.0171 (0.0222)	0.0878 (0.5622)	0.075 (0.3188)	0.956879	81
SmartFONZ	-0.0019 (0.0024)	0.9062 (0.0636)	0.0215 (0.0335)	0.000000	94
Green Cross Health Lim	-0.006 (0.0145)	0.6733 (0.3921)	-0.367 (0.2025)	0.070123	97
Heartland Bank Limited	-0.0051 (0.0063)	0.0879 (0.1701)	0.108 (0.0889)	0.390882	95
Henderson Far East Ind	0.0001 (0.0162)	0.9976 (0.4318)	0.3527 (0.2024)	0.015467	73
JPMorgan Japanese Indu	-0.0083 (0.0121)	0.8257 (0.3265)	0.3418 (0.1686)	0.003888	97
Kingfish Limited Ordin	0.0009 (0.0136)	0.3922 (0.3672)	-0.2091 (0.1896)	0.359690	97
Kathmandu Holdings Lim	0.0011 (0.0200)	1.2977 (0.6523)	0.0862 (0.2655)	0.136169	41
Kircaldie & Stains	0.0023 (0.0047)	0.1781 (0.1277)	0.1715 (0.0659)	0.010278	97
Millennium & Copthor	0.0098 (0.0098)	0.3281 (0.2649)	0.1013 (0.1368)	0.319347	97
SmartMIDZ	-0.0018 (0.0025)	0.8183 (0.0685)	0.0307 (0.0354)	0.000000	97
Mercer Group Limited	-0.0104 (0.0196)	0.1227 (0.5198)	-0.0798 (0.2804)	0.941718	93
Marlin Global Limited	-0.0039 (0.0218)	0.1255 (0.5491)	-0.3457 (0.2766)	0.457727	62
Marsden Maritime Holdi	-0.0019 (0.0060)	0.3729 (0.1617)	-0.0248 (0.0835)	0.078033	97
Methven Limited Ordina	-0.0006 (0.0074)	0.9322 (0.2015)	0.0947 (0.1041)	0.000030	97
Smart MOZY	-0.0015 -0.0045	1.1524 -0.1228	-0.0638 -0.0634	0.000000	97
NPT Limited Ordinary	0.0079 (0.0079)	0.5187 (0.2480)	0.042 (0.0947)	0.110044	51
New Talisman Gold Mi	-0.0251 (0.0210)	0.7365 (0.5679)	0.2459 (0.2933)	0.269840	97

@ SE in parentheses.

continued

continued

Result from fitting the CAPM market model, 2005-2012

	Constant	Beta	Milk Coef	P Value	# Of Obs
New Zealand Oil & Gas	-0.002 (0.0086)	0.779 (0.2332)	0.0367 (0.1204)	0.004380	97
OceanaGold Corporation	-0.0191 (0.0312)	2.2368 (1.1905)	0.1352 (0.6409)	0.102239	20
Opus International Cor	0.0026 (0.0076)	1.0928 (0.1979)	0.1959 (0.0959)	0.000000	68
SmartOZZY	0.0027 (0.0038)	0.9383 (0.1030)	-0.0592 (0.0532)	0.000000	97
Pacific Brands Limited	-0.0239 (0.0185)	2.2837 (0.4908)	0.2279 (0.2570)	0.000031	93
Pyne Gould Corporation	-0.0262 (0.0139)	0.5368 (0.3768)	-0.2966 (0.1946)	0.153792	97
Wrightson Limited	-0.0164 (0.0114)	0.8342 (0.3086)	0.2275 (0.1594)	0.007512	97
Promisia Integrative	0.0088 -0.0656	1.0528 -1.7404	0.1991 -0.9578	0.787249	83
Pumpkin Patch Limited	-0.0107 (0.0092)	1.3482 (0.2484)	0.1428 (0.1283)	0.000001	97
Pan Pacific Petroleum	-0.0028 (0.0133)	1.0888 (0.3608)	-0.4752 (0.1863)	0.001658	97
Rakon Limited Ordinary	-0.0321 (0.0137)	1.3778 (0.3640)	0.2556 (0.1785)	0.000346	84
Rubicon Limited Ordina	-0.0142 (0.0115)	0.7454 (0.3127)	0.1647 (0.1615)	0.029304	97
Scott Technology Limit	-0.0033 (0.0084)	1.2052 (0.2262)	0.068 (0.1168)	0.000003	97
Smiths City Group Limi	-0.0031 (0.0088)	0.5048 (0.2389)	-0.0389 (0.1234)	0.116411	97
SeaDragon Limited Ordi	-0.0148 (0.0306)	0.9552 (0.8200)	-0.4008 (0.4239)	0.373015	95
Seeka Kiwifruit Indust	-0.0165 (0.0114)	0.5088 (0.3094)	-0.0864 (0.1598)	0.254336	97
Sealegs Corporation	-0.0183 (0.0176)	1.8499 (0.4768)	0.2722 (0.2462)	0.000348	97
South Port New Zealand	0.0106 (0.0075)	0.367 (0.2037)	0.018 (0.1052)	0.192439	97
Smartpay Holdings Limi	-0.0167 (0.0245)	0.4236 (0.6627)	-0.2994 (0.3422)	0.597339	97
The City of London Ind	-0.01 (0.0354)	1.2908 (0.9591)	0.168 (0.4952)	0.364314	97

@ SE in parentheses.

continued

continued

Result from fitting the CAPM market model, 2005-2012

	Constant	Beta	Milk Coef	P Value	# Of Obs
Templeton Emerging M	0.0089 (0.0059)	1.2657 (0.1603)	-0.0342 (0.0828)	0.000000	97
Tenon Limited Ordinary	-0.0106 (0.0125)	1.0117 (0.3373)	0.0302 (0.1742)	0.012639	97
T&G Global Limited Ord	-0.0049 -0.0077	0.4743 -0.2089	0.0371 -0.1079	0.070014	97
Tourism Holdings Limit	-0.0158 (0.0082)	1.8922 (0.2224)	0.101 (0.1149)	0.000000	97
Trilogy International	0.0042 (0.0174)	-0.8348 (0.6421)	-0.2647 (0.2260)	0.243832	34
Telstra Corporation	0.0002 (0.0061)	0.5658 (0.1655)	-0.0332 (0.0855)	0.004376	97
Trade Me Group Limited	0.014 (0.0321)	0.9451 (1.0547)	0.0809 (0.4931)	0.463166	13
Turners Limited Ordina	-0.0272 (0.0256)	2.1944 (0.6919)	-0.2227 (0.3573)	0.008770	97
SmartTENZ	-0.0039 (0.0017)	0.9434 (0.0452)	-0.0049 (0.0234)	0.000000	97
TRS Investments Limite	-0.1634 (0.0972)	1.2304 (2.5103)	-0.6355 (1.4846)	0.840115	77
TeamTalk Limited Ordin	0.0071 (0.0055)	0.5008 (0.1481)	-0.0593 (0.0765)	0.004602	97
Veritas Investments	-0.0188 (0.0474)	1.2349 (1.2843)	-0.1461 (0.6632)	0.632218	97
VMob Group Limited Ord	-0.0221 (0.0321)	-1.1644 (0.8271)	-0.2994 (0.4540)	0.273218	86
Wellington Drive Techn	-0.0442 (0.0163)	0.7903 (0.4406)	0.217 (0.2275)	0.108173	97
Xero Limited Ordinary	0.0298 (0.0130)	0.8427 (0.3444)	-0.1483 (0.1636)	0.043388	72

@ SE in parentheses.

Appendix 5

**Result from fitting the CAPM market model,
2013-2016**

Result from fitting the CAPM market model, 2013-2016

	Constant	Beta	Milk Coef	P Value	# of Obs
Auckland Intl Airport	0.0112 (0.0057)	1.1041 (0.1970)	0.0024 (0.0447)	0.000007	40
Air New Zealand	0.01 (0.0122)	1.3936 (0.4222)	-0.0024 (0.0957)	0.006581	40
ANZ Banking Group	-0.0159 (0.0097)	1.1532 (0.3377)	0.0227 (0.0765)	0.003985	40
Argosy Property	0.0059 (0.0045)	0.4475 (0.1549)	0.0298 (0.0351)	0.009503	40
A2 Milk	0.0208 (0.0248)	0.9768 (0.8615)	0.1433 (0.1952)	0.333586	40
Contact Energy	-0.0082 (0.0110)	0.8885 (0.3826)	-0.1057 (0.0867)	0.056920	40
Coats Group	-0.0083 (0.0146)	0.5977 (0.5084)	0.0024 (0.1152)	0.484383	40
EBOS Group	0.0235 (0.0097)	0.2573 (0.3357)	0.2113 (0.0761)	0.013741	40
Fletcher Building	-0.0176 (0.0074)	1.5381 (0.2583)	-0.0017 (0.0585)	0.000002	40
Fisher & Paykel Hlthcr	0.0317 (0.0096)	0.378 (0.3342)	-0.014 (0.0757)	0.524321	40
Freightways	0.0054 (0.0078)	0.7251 (0.2716)	0.028 (0.0616)	0.023997	40
Goodman Property Trust	0.0058 (0.0050)	0.5463 (0.1727)	0.0533 (0.0391)	0.002383	40
Hellaby Holdings	0.0007 (0.0079)	-0.021 (0.2741)	0.0171 (0.0621)	0.961448	40
Hallenstein Glasson Hdg	-0.0153 (0.0127)	0.7303 (0.4416)	-0.003 (0.1001)	0.249196	40
Infratil	0.0026 (0.0080)	0.7519 (0.2765)	-0.0871 (0.0627)	0.022421	40
Kiwi Property Group	0.0052 (0.0063)	0.4197 (0.2183)	0.0205 (0.0495)	0.123852	40
Mainfreight	0.0025 (0.0065)	0.4984 (0.2245)	-0.0828 (0.0509)	0.047265	40
Metlifecare	-0.0016 (0.0104)	1.1939 (0.3603)	-0.0594 (0.0817)	0.007273	40
Michael Hill Intl	-0.0104 (0.0092)	0.8331 (0.3204)	0.0912 (0.0726)	0.011361	40
Nuplex Industries	-0.001 (0.0119)	1.4756 (0.4146)	-0.0793 (0.0940)	0.003751	40

@ SE in parentheses.

continued

continued

Result from fitting the CAPM market model, 2013-2016

	Constant	Beta	Milk Coef	P Value	# of Obs
NZX	-0.0017 (0.0067)	0.2143 (0.2329)	-0.0115 (0.0528)	0.650206	40
New Zealand Refining	0.0081 (0.0136)	0.0618 (0.4727)	0.0018 (0.1071)	0.990393	40
Precinct Properties NZ	0.0088 (0.0053)	0.1911 (0.1827)	0.0291 (0.0414)	0.382353	40
Pacific Edge Ltd	-0.0251 (0.0323)	2.4275 (1.1210)	-0.2238 (0.2541)	0.093333	40
Property For Industry	0.0082 (0.0040)	0.2612 (0.1381)	-0.0154 (0.0313)	0.172276	40
Port Of Tauranga	0.0065 (0.0058)	0.4621 (0.2029)	0.0589 (0.0460)	0.022784	40
Restaurant Brands NZ	0.0084 (0.0064)	0.9024 (0.2229)	-0.0027 (0.0505)	0.000818	40
Ryman Healthcare	0.0037 (0.0089)	1.0673 (0.3089)	0.0619 (0.0700)	0.002050	40
Sanford	0.014 (0.0083)	-0.1299 (0.2869)	0.0141 (0.0650)	0.891979	40
Sky City Entm Gp	-0.0058 (0.0075)	1.2675 (0.2616)	0.0128 (0.0593)	0.000063	40
Skellerup Holdings	-0.0002 (0.0101)	0.3015 (0.3490)	0.1214 (0.0791)	0.162902	40
Sky Network Television	-0.0118 (0.0099)	1.2735 (0.3452)	0.0501 (0.0782)	0.001382	40
Spark New Zealand	0.0042 (0.0089)	1.0195 (0.3097)	-0.0937 (0.0702)	0.006233	40
Steel And Tube Holdings	-0.0016 (0.0114)	0.5708 (0.3975)	-0.06 (0.0901)	0.329493	40
Trustpower	-0.0032 (0.0063)	0.4322 (0.2192)	-0.0536 (0.0497)	0.117809	40
Tower	-0.0056 (0.0150)	0.2612 (0.5192)	-0.2128 (0.1177)	0.197764	40
Vector Ltd	0.0105 (0.0064)	0.0707 (0.2230)	0.0353 (0.0505)	0.703038	40
Vital Healthcare Pr Tst	0.0159 (0.0053)	0.1493 (0.1852)	0.0624 (0.0420)	0.186926	40
Westpac Banking Corp NZ	-0.0129 (0.0089)	1.3357 (0.3089)	0.0247 (0.0700)	0.000279	40

@ SE in parentheses.

continued

continued

Result from fitting the CAPM market model, 2013-2016

	Constant	Beta	Milk Coef	P Value	# of Obs
Warehouse Group	-0.0066 (0.0094)	0.9039 (0.3247)	0.009 (0.0736)	0.022878	40
Abano Healthcare Group	0.0063 (0.0100)	0.1433 (0.3455)	-0.0724 (0.0783)	0.628574	40
Australian Foundation	-0.0028 (0.0063)	0.4302 (0.2204)	0.0764 (0.0500)	0.030344	40
Allied Farmers Limited	-0.0214 (0.0461)	2.594 (1.6022)	-0.2184 (0.3631)	0.260762	40
AMP Limited Ordinary	-0.0129 (0.0105)	1.5066 (0.3639)	-0.0477 (0.0825)	0.000739	40
Aorere Resources Limit	-0.054 (0.0427)	0.7266 (1.4815)	-0.0164 (0.3357)	0.883441	40
APN News & Media Limit	-0.0179 (0.0240)	3.0862 (0.8325)	0.0095 (0.1887)	0.002070	40
ASB Capital Limited	0.0136 (0.0066)	-0.5699 (0.2275)	0.0524 (0.0516)	0.044654	40
Augusta Capital Limite	0.0107 (0.0070)	0.1832 (0.2424)	-0.0383 (0.0549)	0.636026	40
AWF Madison Group Limi	0.0001 (0.0101)	0.461 (0.3504)	0.1992 (0.0794)	0.012912	40
Briscoe Group Limited	0.0108 (0.0071)	0.2313 (0.2480)	0.0488 (0.0562)	0.370285	40
Bethunes Investments	-0.0268 (0.0266)	0.3373 (0.9250)	-0.0183 (0.2096)	0.933955	40
The Bankers Investment	-0.0036 (0.0049)	0.8435 (0.1694)	0.0059 (0.0384)	0.000044	40
BLIS Technologies Limi	0.0152 (0.0368)	0.3014 (1.2773)	-0.1997 (0.2895)	0.779747	40
Barramundi Limited O	-0.0002 (0.0057)	0.0204 (0.1979)	0.0519 (0.0448)	0.483725	40
Cavalier Corporation	-0.0317 (0.0246)	0.8485 (0.8549)	0.0564 (0.1938)	0.540963	40
CDL Investments New	0.0154 (0.0084)	-0.2041 (0.2912)	0.0336 (0.0660)	0.721942	40
The Colonial Motor Cor	0.0038 (0.0067)	1.1325 (0.2314)	-0.0562 (0.0524)	0.000080	40
Chorus Limited (NS)	-0.02 (0.0189)	2.2451 (0.6570)	-0.28 (0.1489)	0.002996	40
Comvita Limited Ordina	0.037 (0.0140)	-0.4398 (0.4874)	-0.0302 (0.1105)	0.598662	40
Cleanaway Waste Manage	-0.044 (0.0695)	3.6222 (2.4126)	0.8553 (0.5468)	0.064444	40

Continued

@ SE in parentheses.

continued

Result from fitting the CAPM market model, 2013-2016

	Constant	Beta	Milk Coef	P Value	# of Obs
Delegat Group Limited	0.017 (0.0095)	0.2019 (0.3289)	0.0176 (0.0745)	0.774025	40
Downer EDI Limited Ord	0.0036 (0.0015)	-0.0257 (0.0533)	-0.01 (0.0121)	0.572946	40
Finzsoft Solutions Lim	0.0332 (0.0400)	0.8275 (1.3904)	-0.2809 (0.3151)	0.606613	40
SmartFONZ	0.0014 (0.0021)	0.8565 (0.0715)	0.014 (0.0162)	0.000000	40
Fonterra Shareholder	-0.0076 (0.0085)	0.5265 (0.2958)	0.0144 (0.0670)	0.182383	40
Green Cross Health Lim	0.0226 (0.0122)	0.3021 (0.4228)	0.0951 (0.0958)	0.402655	40
Heartland Bank Limited	0.0107 (0.0083)	0.782 (-0.2869)	0.0566 (-0.065)	0.013879	40
Henderson Far East Ind	-0.0028 (0.0080)	0.4552 (0.3329)	-0.0535 (0.0657)	0.319896	31
JPMorgan Japanese Indu	-0.035 (0.0390)	1.9145 (1.5446)	0.2995 (0.2900)	0.231736	25
Kingfish Limited Ordin	0.0067 (0.0038)	0.2074 (0.1335)	0.0445 (0.0303)	0.068739	40
Kathmandu Holdings Lim	-0.0029 (0.0218)	0.2318 (0.7561)	-0.0638 (0.1714)	0.903971	40
Kircaldie & Stains	0.0039 (0.0165)	-0.2933 (0.5736)	-0.061 (0.1300)	0.740552	40
Millennium & Copthor	0.0333 (0.0206)	-0.0058 (0.7138)	-0.0291 (0.1618)	0.982691	40
SmartMIDZ	0.005 (0.0029)	0.7483 (0.1007)	-0.0184 (0.0228)	0.000000	40
Mercer Group Limited	-0.0341 (0.0370)	-1.1513 (1.2829)	-0.1392 (0.2908)	0.536481	40
Marlin Global Limited	0.0068 (0.0062)	-0.0964 (0.2151)	0.0513 (0.0487)	0.552187	40
Marsden Maritime Holdi	0.0065 (0.0065)	0.3547 (0.2264)	0.0885 (0.0513)	0.043755	40
Methven Limited Ordina	0.0002 (0.0121)	0.3469 (0.4194)	-0.0653 (0.0951)	0.608771	40
Smart MOZY	-0.0035 (0.0063)	0.6799 (0.2192)	-0.0695 (0.0497)	0.009430	40
NPT Limited Ordinary	0.007 (0.0062)	0.1394 (0.2154)	0.014 (0.0488)	0.741057	40
New Talisman Gold Mi	-0.0198 (0.0368)	0.88 (1.2788)	-0.2698 (0.2898)	0.561198	40

@ SE in parentheses.

continued

continued

Result from fitting the CAPM market model, 2013-2016

	Constant	Beta	Milk Coef	P Value	# of Obs
New Zealand Oil & Gas	-0.0193 (0.0089)	0.5804 (0.3106)	-0.0914 (0.0704)	0.116799	40
OceanaGold Corporation	0.007 (0.0349)	-0.0335 (1.2102)	-0.1486 (0.2743)	0.853391	40
Opus International Cor	-0.0088 (0.0085)	0.3293 (0.2944)	-0.0442 (0.0667)	0.478065	40
SmartOZZY	-0.0083 (0.0060)	0.724 (0.2081)	-0.0248 (0.0472)	0.004702	40
Pacific Brands Limited	0.0225 (0.0204)	-0.7384 (0.7087)	-0.0766 (0.1606)	0.459396	40
Pyne Gould Corporation	-0.0035 (0.0164)	0.1534 (0.5691)	-0.1364 (0.1290)	0.566422	40
Wrightson Limited	-0.0079 (0.0147)	1.1379 (0.5109)	-0.1783 (0.1158)	0.051188	40
Promisia Integrative	0.0309 (0.0339)	-1.9236 (1.1759)	0.4066 (0.2665)	0.128489	40
Pumpkin Patch Limited	-0.0841 (0.0279)	1.1018 (0.9670)	-0.0231 (0.2192)	0.516816	40
Pan Pacific Petroleum	-0.0474 (0.0248)	1.0185 (0.8617)	0.0005 (0.1953)	0.482827	40
Rakon Limited Ordinary	-0.0445 (0.0227)	2.6076 (0.7886)	-0.3421 (0.1787)	0.003761	40
Rubicon Limited Ordina	-0.0182 (0.0168)	1.0774 (0.5846)	-0.1377 (0.1325)	0.149181	40
Scott Technology Limit	-0.0162 (0.0125)	0.9131 (0.4337)	0.0696 (0.0983)	0.066903	40
Smiths City Group Limi	0.0029 (0.0078)	-0.1912 (0.2713)	-0.1331 (0.0615)	0.059311	40
SeaDragon Limited Ordi	-0.0168 (0.0288)	0.1642 (1.0004)	0.0681 (0.2267)	0.930871	40
Seeka Kiwifruit Indust	0.0457 (0.0169)	-0.183 (0.5852)	-0.0242 (0.1326)	0.922517	40
Sealegs Corporation	-0.0036 (0.0295)	-0.2857 (1.0253)	0.2924 (0.2324)	0.450916	40
South Port New Zealand	0.0173 (0.0086)	-0.1372 (0.2969)	-0.0027 (0.0673)	0.889209	40
Smartpay Holdings Limi	-0.0228 (0.0228)	0.7731 (0.7929)	0.024 (0.1797)	0.587305	40
The City of London Ind	-0.0431 (0.0818)	3.9239 (2.8417)	-0.1463 (0.6440)	0.385258	40

@ SE in parentheses.

continued

continued

Result from fitting the CAPM market model, 2013-2016

	Constant	Beta	Milk Coef	P Value	# of Obs
Templeton Emerging M	-0.02 (0.0091)	0.954 (0.3143)	-0.099 (0.0712)	0.011100	40
Tenon Limited Ordinary	0.0226 (0.0144)	0.4554 (0.5017)	-0.0711 (0.1137)	0.590407	40
T&G Global Limited Ord	0.0094 (0.0073)	0.076 (0.2534)	0.0279 (0.0574)	0.818082	40
Tourism Holdings Limit	0.0349 (0.0114)	0.3461 (0.3959)	-0.1032 (0.0897)	0.410521	40
Trilogy International	0.0355 (0.0274)	-0.3873 (0.9522)	-0.0437 (0.2158)	0.882163	40
Telstra Corporation	0.0004 (0.0086)	0.4718 (0.2972)	-0.0392 (0.0673)	0.274815	40
Trade Me Group Limited	-0.0013 (0.0102)	0.6585 (0.3551)	-0.0468 (0.0805)	0.180237	40
Turners Limited Ordina	0.0378 (0.0653)	1.3028 (2.2668)	-0.2667 (0.5137)	0.772214	40
SmartTENZ	0.0002 (0.0019)	0.8488 (0.0669)	0.0262 (0.0152)	0.000000	40
TRS Investments Limite	-0.0646 (0.0690)	7.2263 (2.3968)	-0.2195 (0.5432)	0.015457	40
TeamTalk Limited Ordin	-0.038 (0.0223)	1.0312 (0.7739)	-0.0841 (0.1754)	0.399632	40
Veritas Investments	-0.0625 (0.0198)	0.8957 (0.6880)	-0.3068 (0.1559)	0.099633	40
VMob Group Limited Ord	-0.0165 (0.1409)	0.4124 (4.8925)	-0.7126 (1.1088)	0.809483	40
Wellington Drive Techn	-0.0067 (0.0327)	-0.3012 (1.1345)	-0.0237 (0.2571)	0.954401	40
Xero Limited Ordinary	0.0008 (0.0275)	1.8664 (0.9555)	0.522 (0.2165)	0.005400	40

@ SE in parentheses.